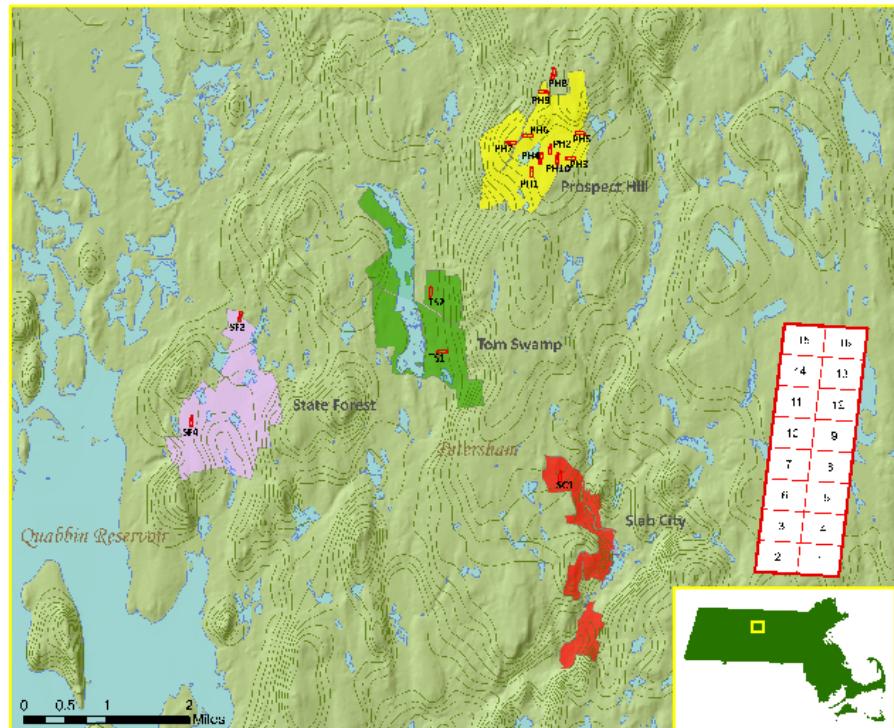


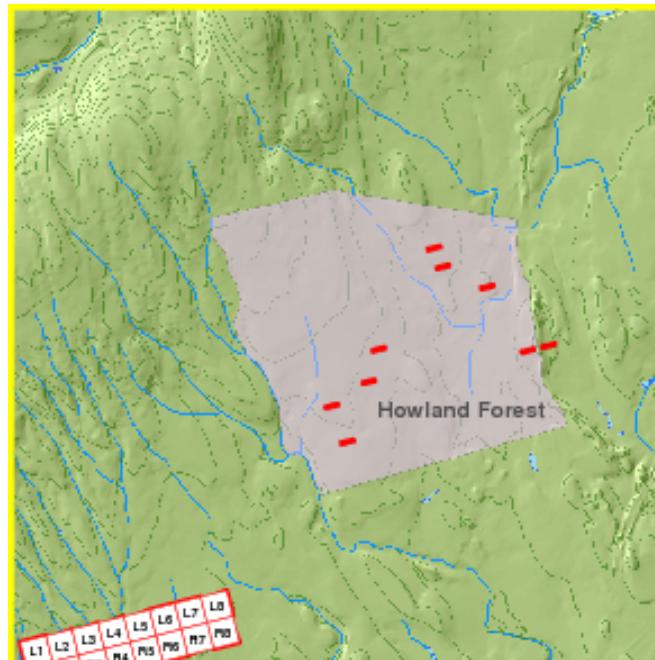
Analyzing the relationship between radar backscatter and forest biomass through UAVSAR observations

Razi Ahmed
Paul Siqueira, Scott Hensley

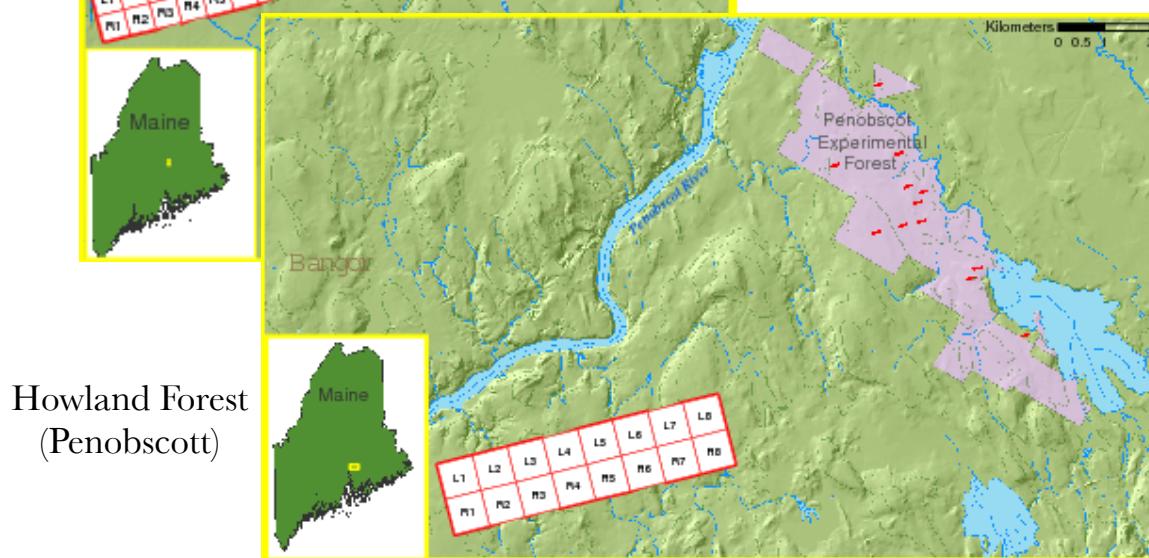
Jet Propulsion Laboratory,
California Institute of Technology



Harvard forest



Howland Forest

Howland Forest
(Penobscott)

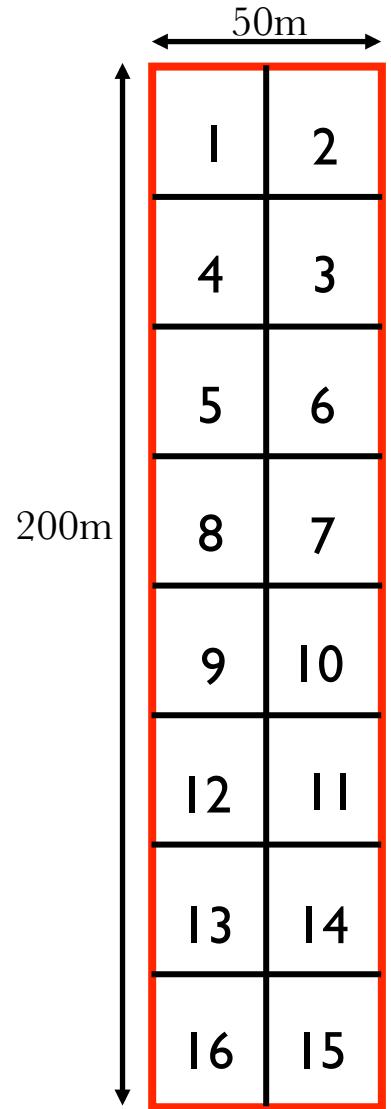
- Species, diameters, condition (live/dead) for every tree above 10cm in diameter per subplot

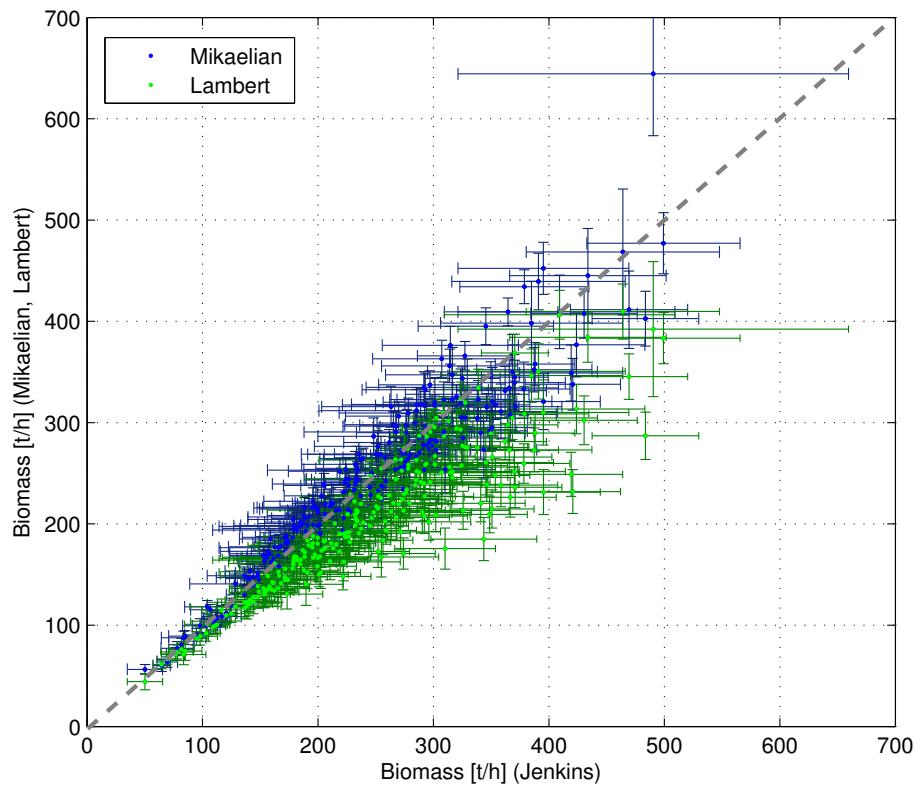
- Harvard Forest

- 1200 Hectares of mixed forest
 - 15 1-hectares plots (240 subplots)
 - Dominant Species
 - Red Oak, Red Maple, White Pine, Eastern Hemlock

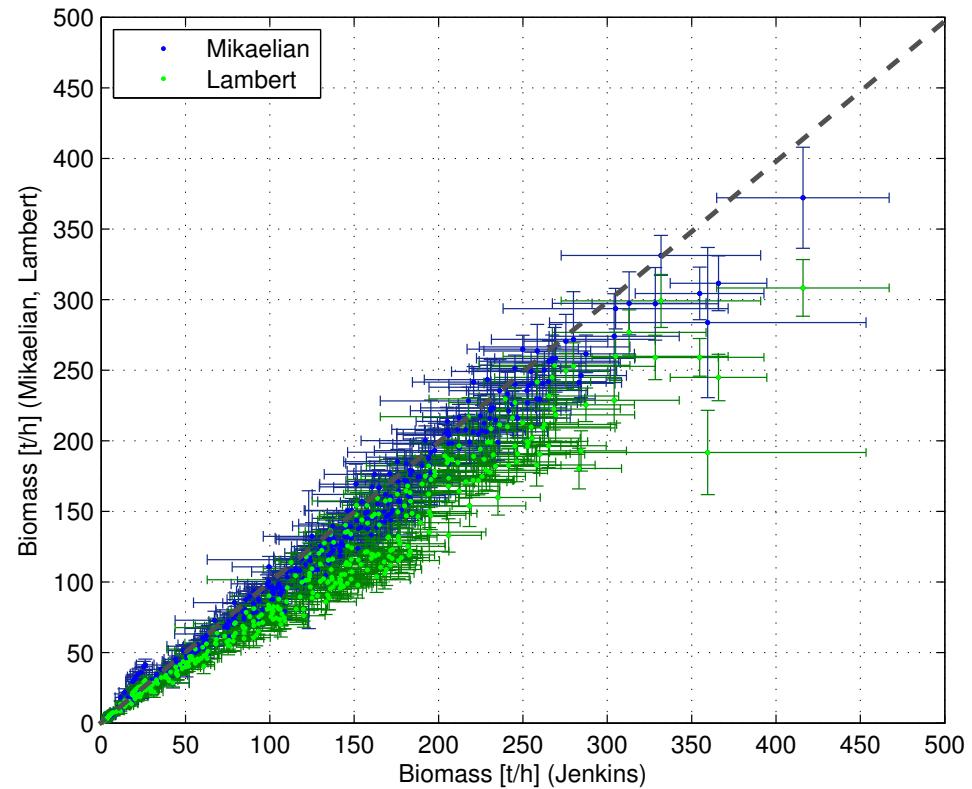
- Howland Forest

- 500 Hectares of mixed forest
 - 23 1-hectares plots (368 subplots)
 - Dominant Species
 - Spruce, Fir, Hemlock, Pines and Maples

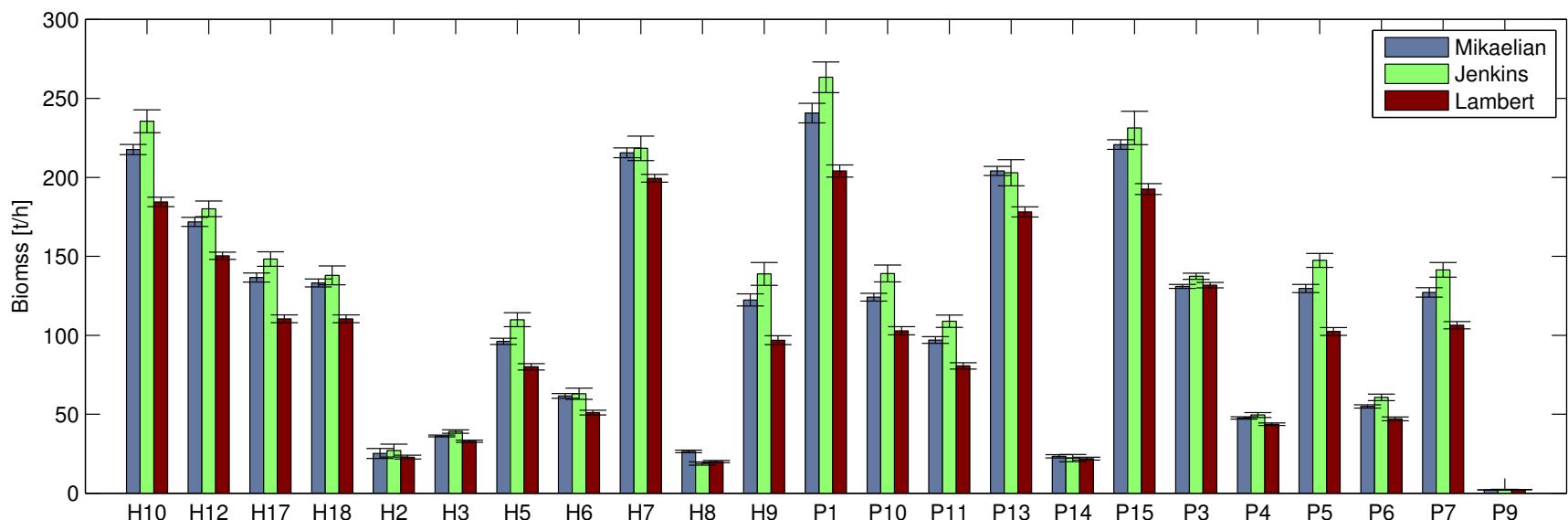
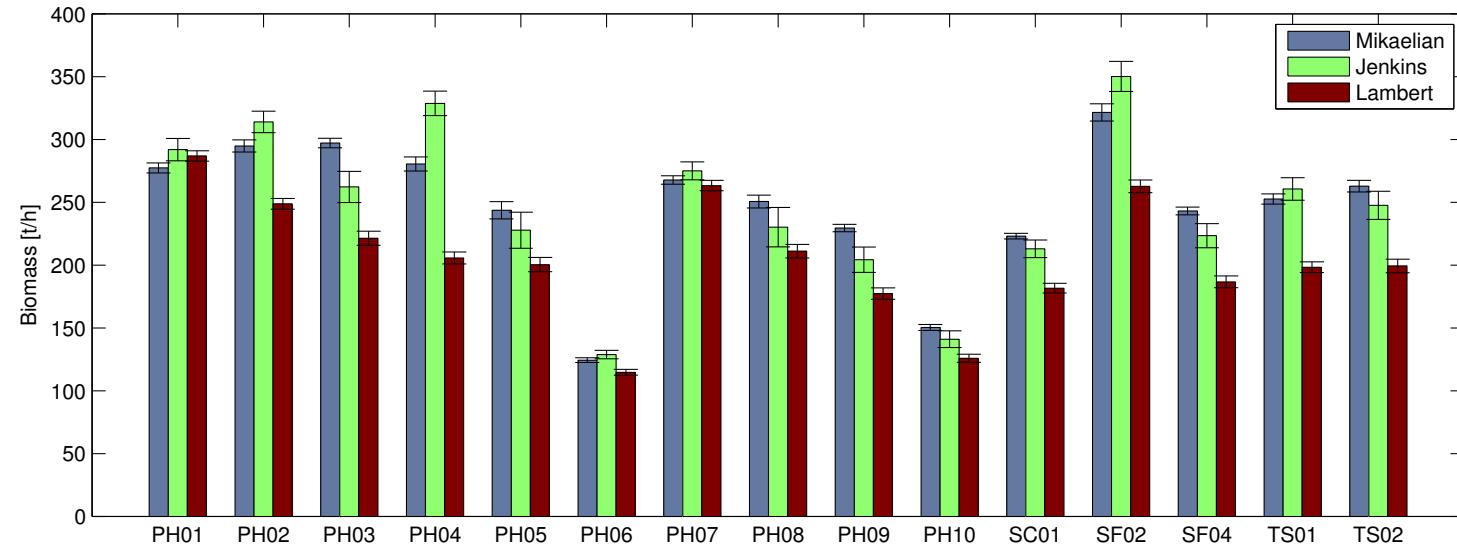




Harvard forest



Howland Forest

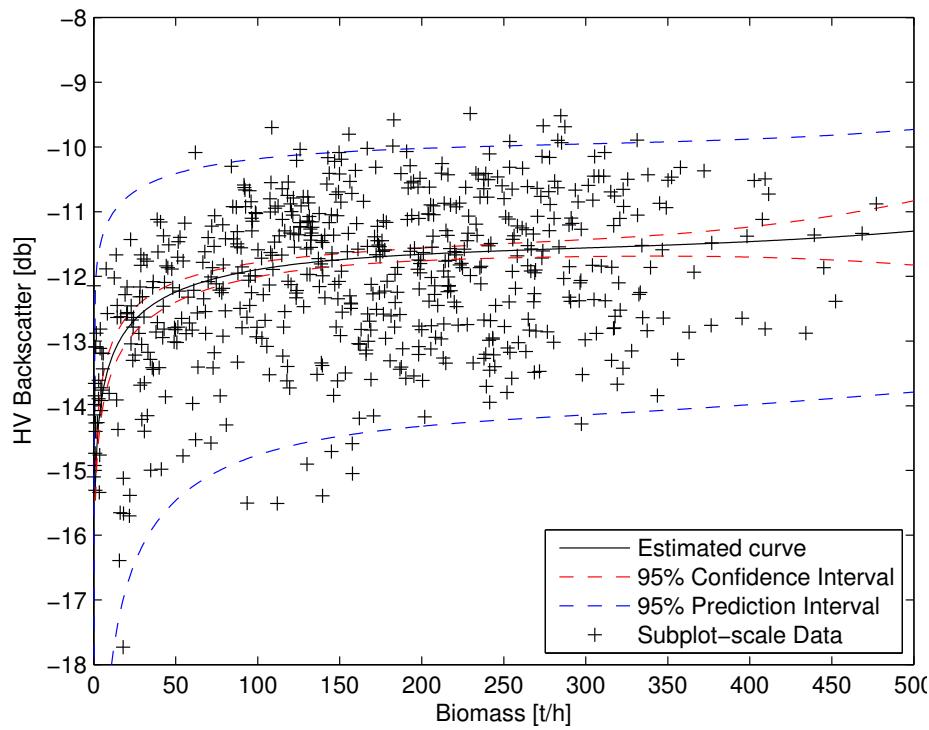


- UAVSAR data was collected on dates from August 6-17, 2009.
- Similar lines were collected over the Howland/Penobscott Forests during the same time frame (August 5-14, 2009).

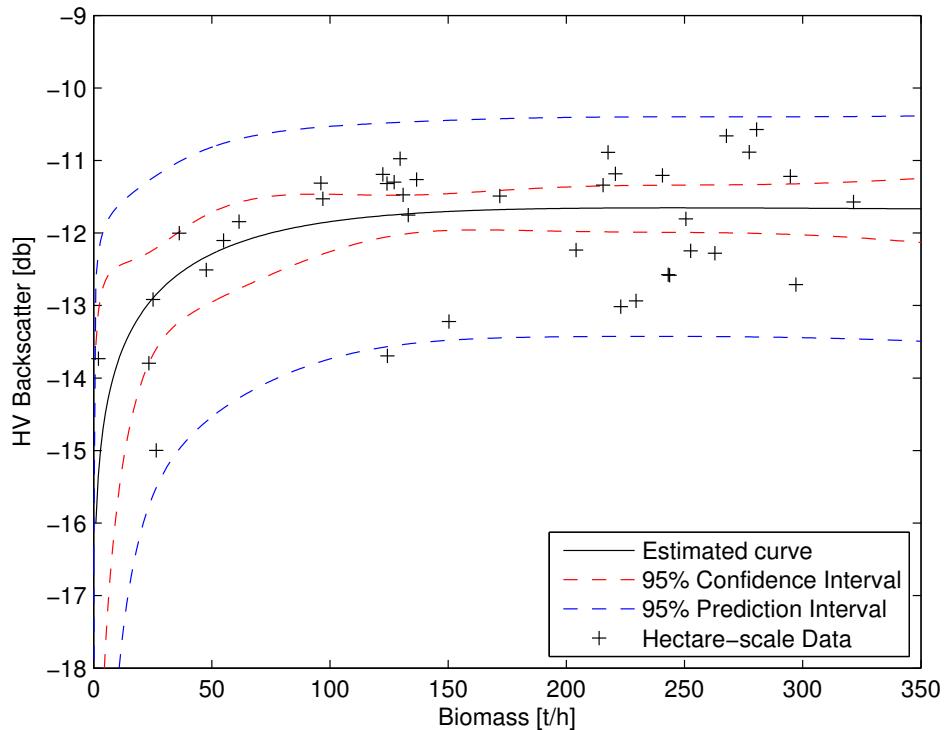
UAVSAR Image of Harvard Forest Region

Track Number	Date	Time of Day
1	August 6, 2009	13:59:57
2	August 6, 2009	14:31:27
3	August 6, 2009	15:01:56
4	August 6, 2009	15:32:54
5	August 8, 2009	15:13:26
6	August 8, 2009	15:43:51
7	August 8, 2009	16:14:49
8	August 13, 2009	19:15:09
9	August 13, 2009	19:48:39
10	August 16, 2009	13:51:11
11	August 17, 2009	14:57:43
12	August 17, 2009	13:58:03
13	August 17, 2009	13:28:53



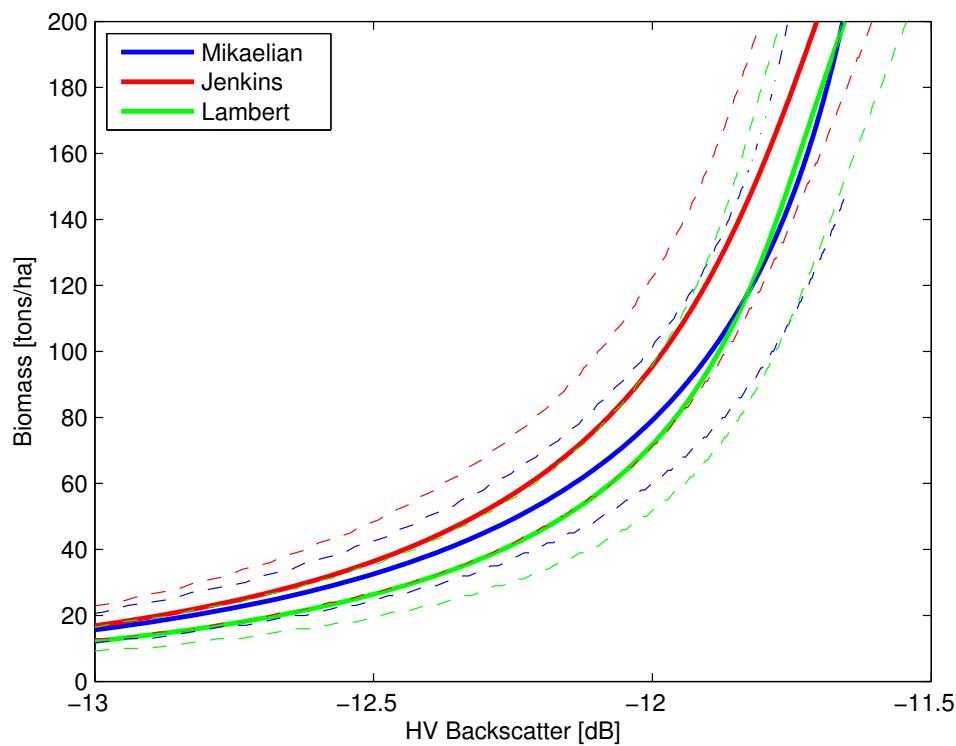


subplots

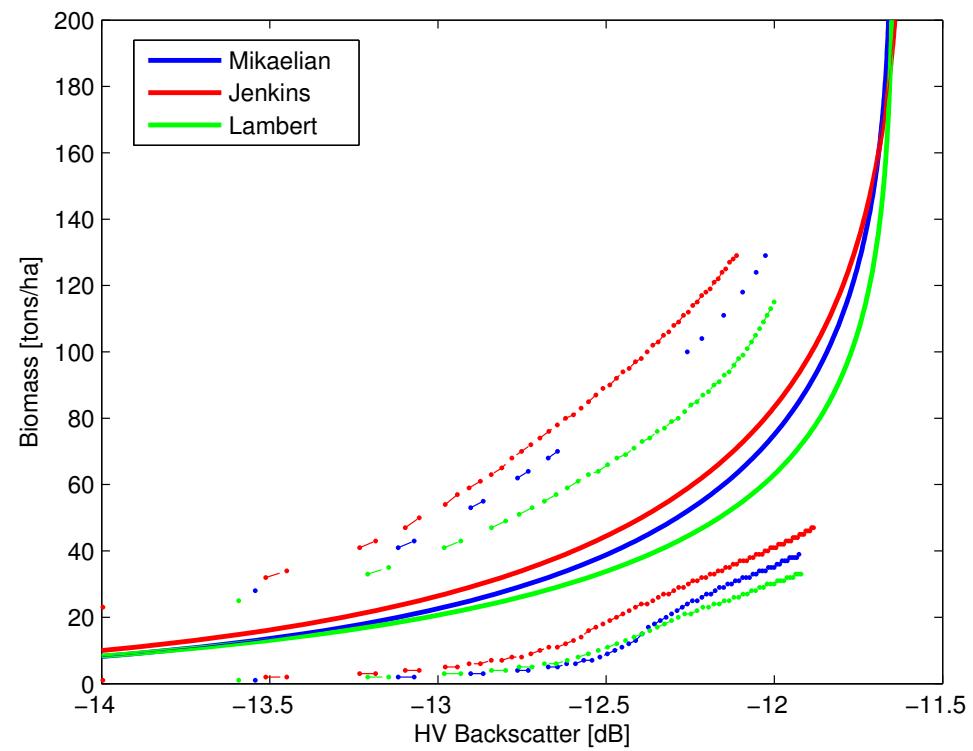


hectares

$$\sigma = \beta_0 (1 - e^{-\beta_1 M}) + \beta_2 M^{0.2} e^{-\beta_1 M}$$

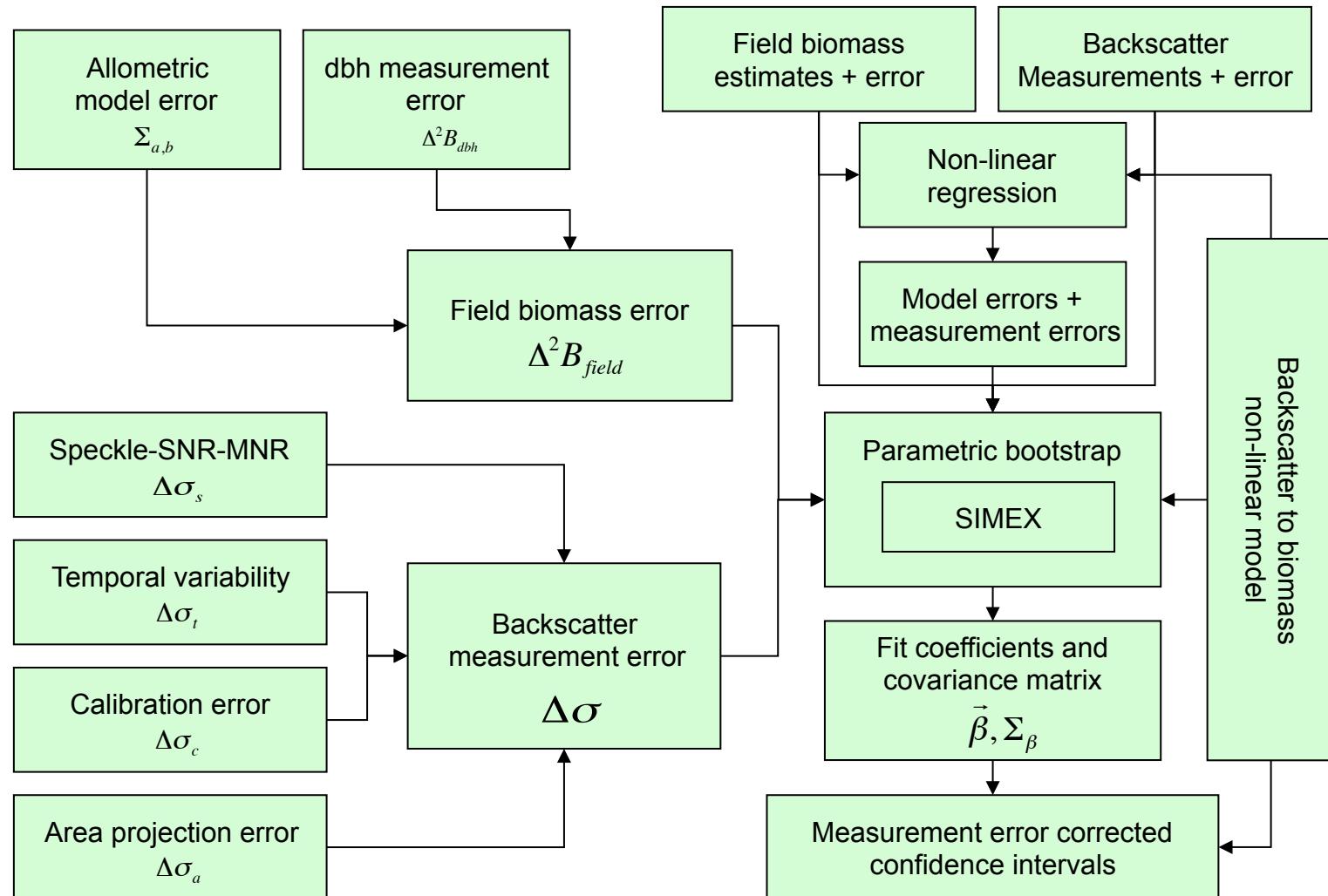


subplots

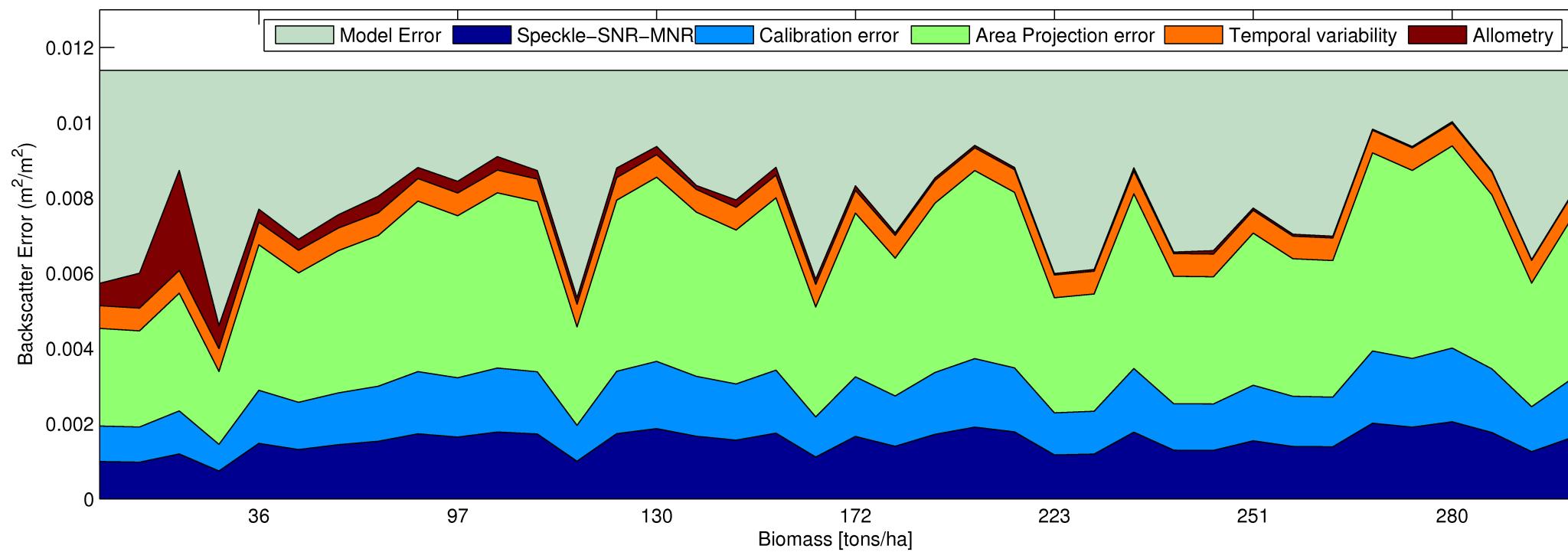
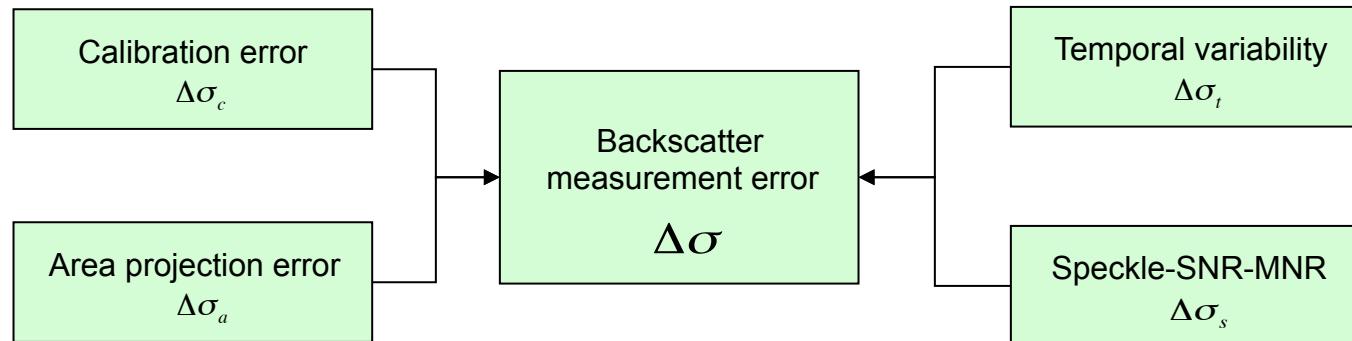


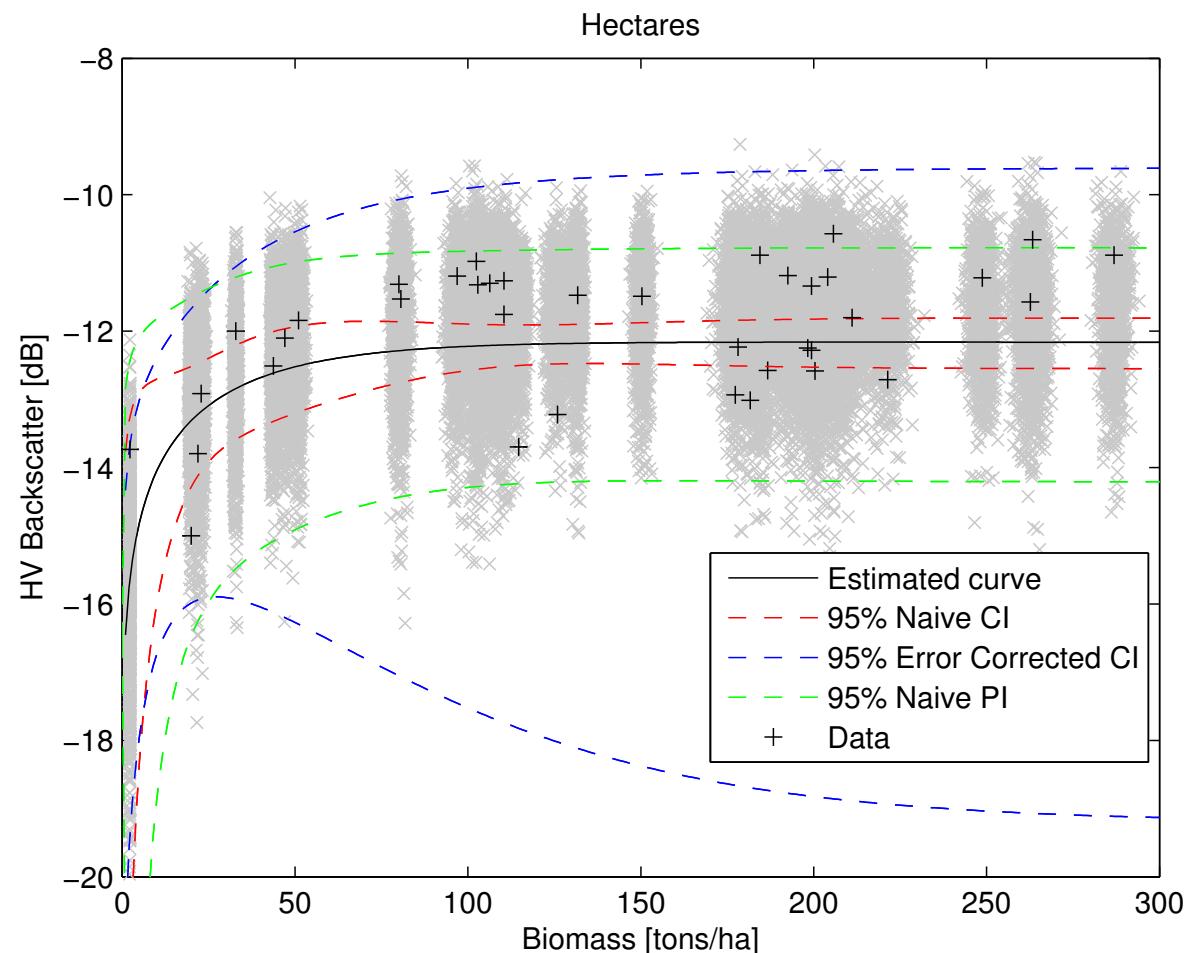
hectares

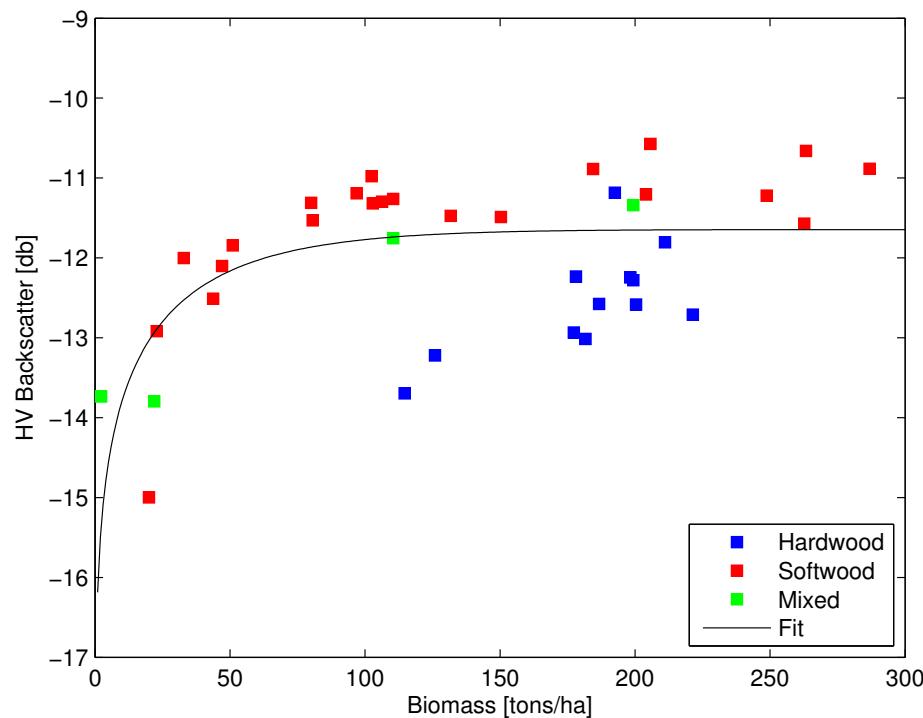
- Various types of errors in the non-linear backscatter-biomass relationship
 - Measurement errors in radar backscatter $\Delta\sigma$
 - Measurement errors in biomass $\Delta^2 B_{field}$
 - Natural uncertainty in the relationship (model error)
 - RMS residuals from the regression
 - Confidence intervals and variance of the fit coefficients $\vec{\beta}, \Sigma_\beta$
- How do all these errors fit together? **Non-linear two stage bootstrap**



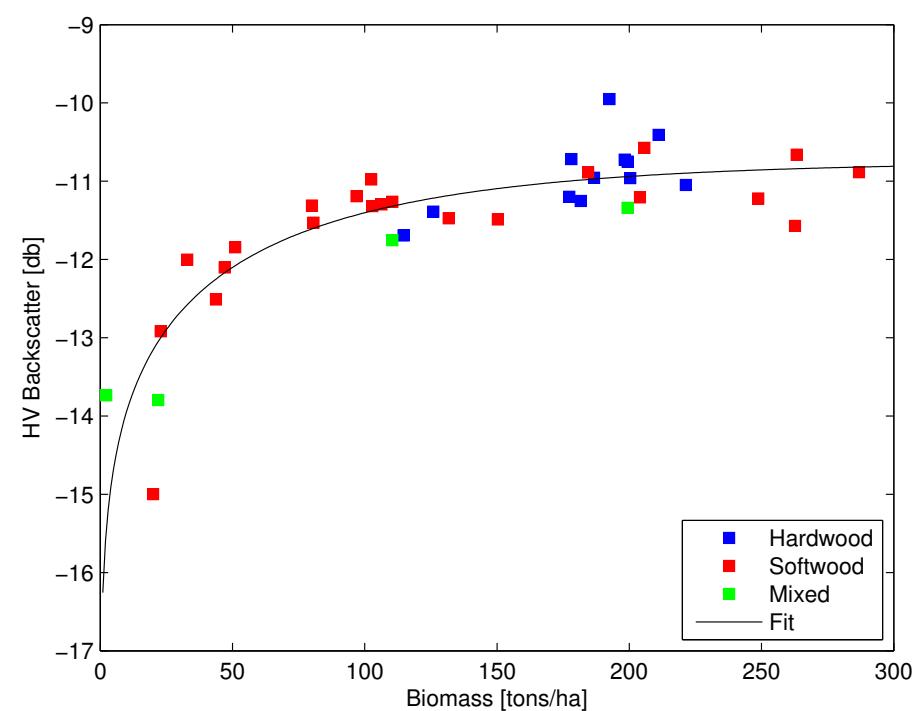
Modeling backscatter errors



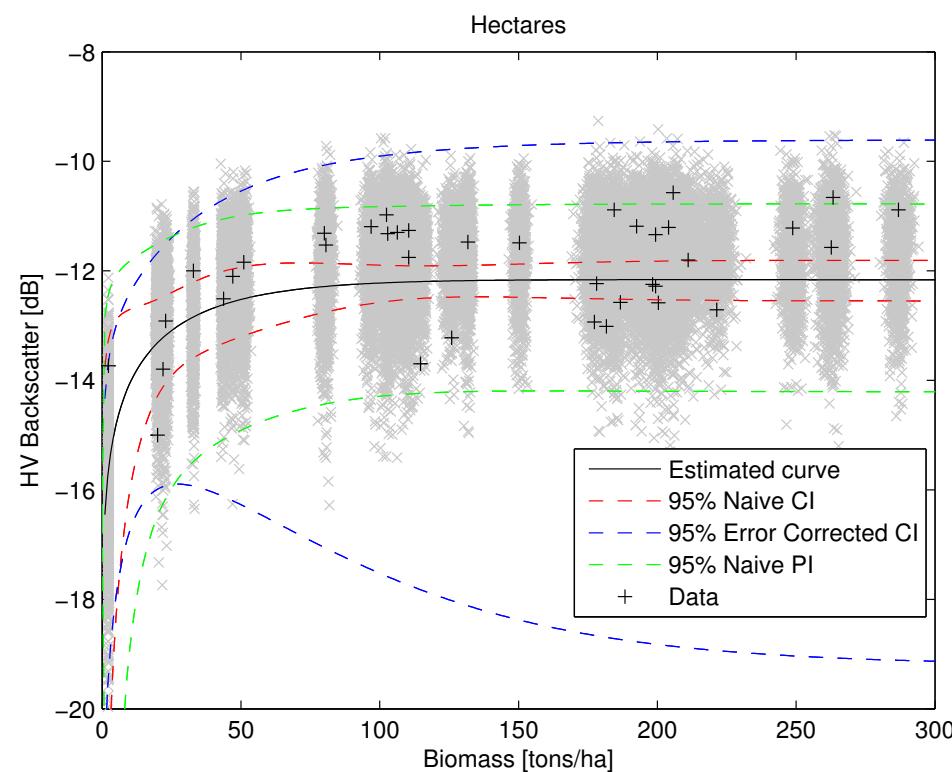




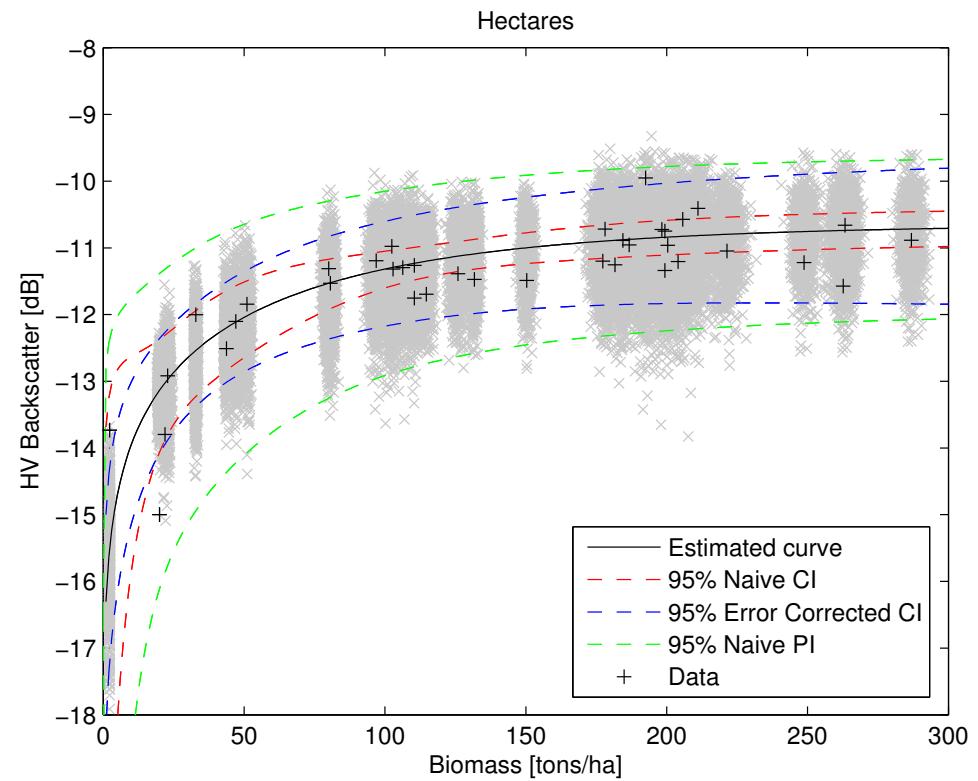
Dependence of radar backscatter
on species class



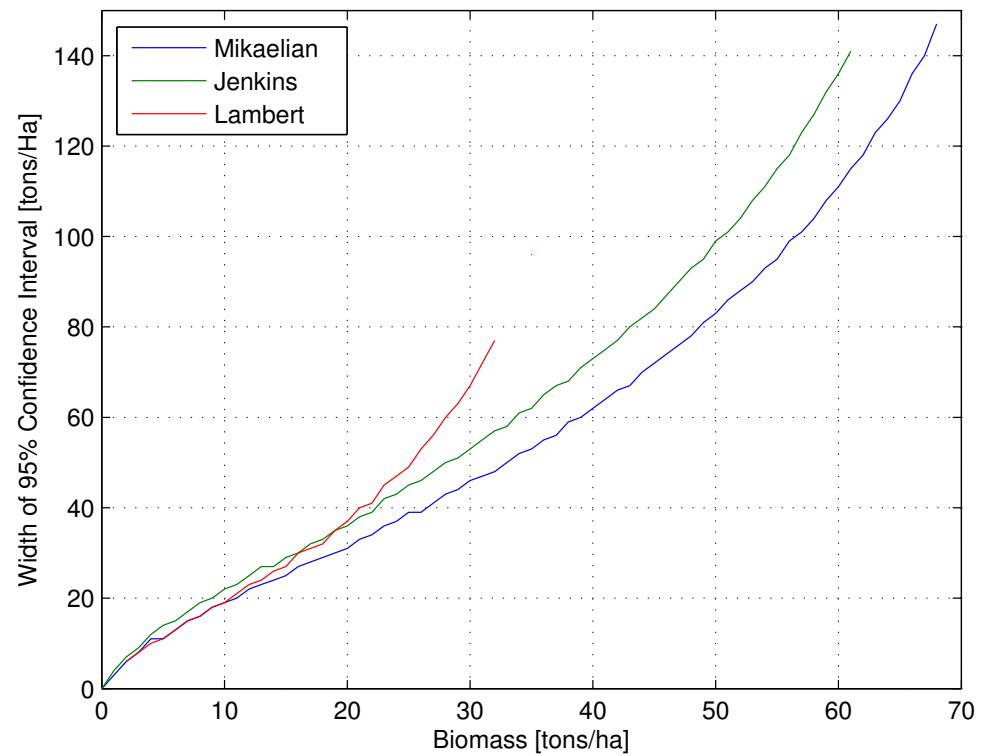
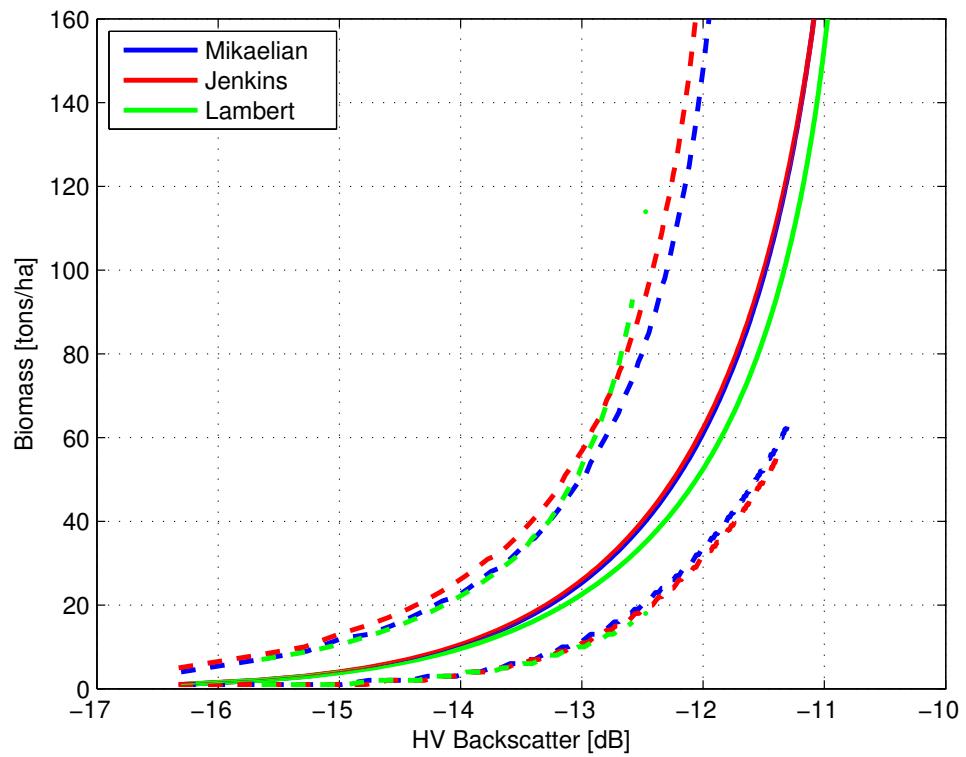
Reduced model error as the mean
separation between hardwood/softwood
pixels is removed

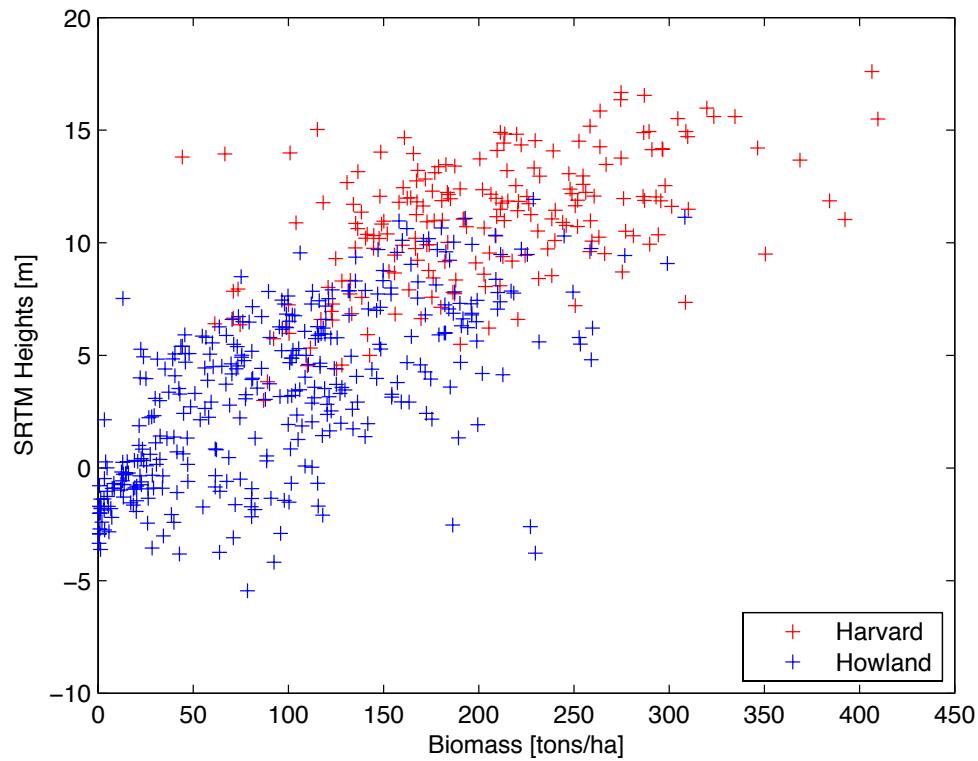


Large model error

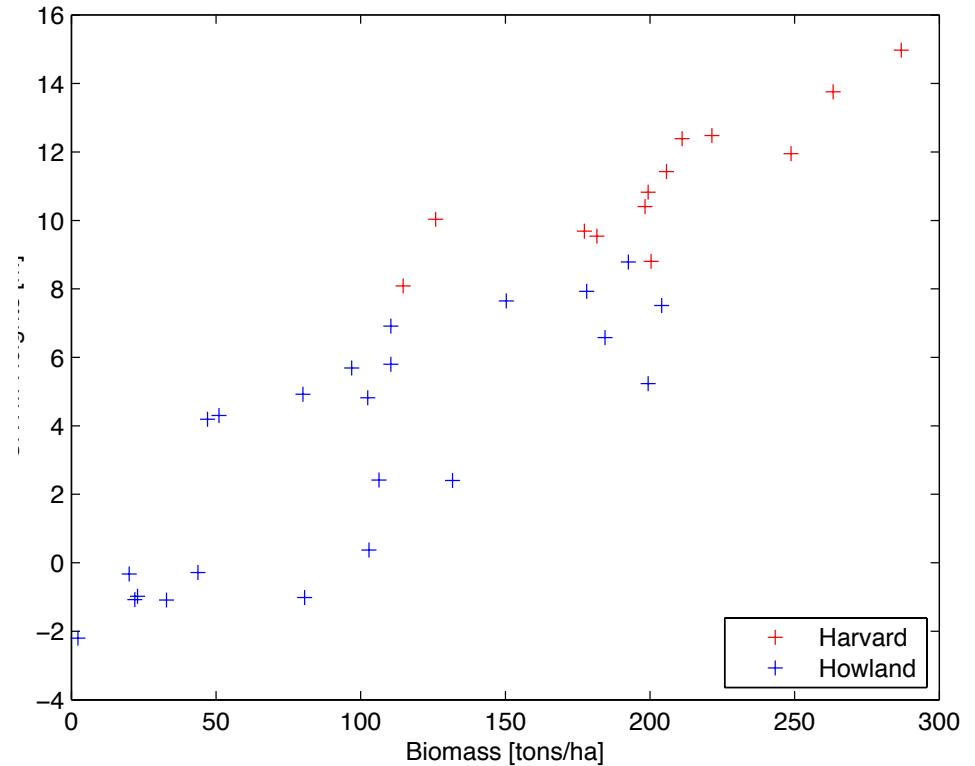


Reduced model error





	R ²	RMSE [tons/ha]
Harvard	0.27	60.03
Howland	0.42	51.37
Combined	0.58	54.83
RH100	0.43	68.58



	R ²	RMSE [tons/ha]
Harvard	0.72	25.66
Howland	0.63	38.36
Combined	0.79	34.55
RH100	0.69	39.59